

# Machine Vision Algorithms for Autonomous Small Body Navigation

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## Abstract

Due to the small size, irregular shape and variable surface properties of small bodies, accurate motion and position estimation is needed for safe and precise small body exploration. Because of the communication delay induced by the large distances between the earth and targeted small bodies, landing on small bodies must be done autonomously using on-board sensors and algorithms. Current navigation technology does not provide the precision necessary to accurately land on small bodies, so novel navigation techniques must be developed. Optical sensor processing by machine vision algorithms offer a possible solution to this difficult autonomous navigation and control problem. We are developing a suite of machine vision algorithms for autonomous navigation around small bodies based on optical sensor input. Optical sensor data can come from many different modalities including passive monocular image streams, stereo vision, laser altimetry, and scanning laser radar imagery. In an effort to understand the advantages and disadvantages of each modality, we are developing navigation algorithms for all of these modalities. This paper surveys our recently developed algorithms for motion and position estimation during orbit around and descent to the surface of small bodies. Specific technologies highlighted will be: motion and absolute position estimation using monocular image streams and laser altimetry; motion and absolute position estimation from scanning laser radar imagery; and absolute position estimation through detection of crater landmarks in asteroid imagery. The navigation results from these algorithms provide a basis for comparing modalities and lay the groundwork for sensor and algorithm selection for future small body exploration missions.

## Additional Contributors

Dr. Larry H. Matthies, JPL  
A. Miguel San Martin, JPL



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# **Machine Vision Algorithms for Autonomous Small Body Navigation**

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# Problem Statement

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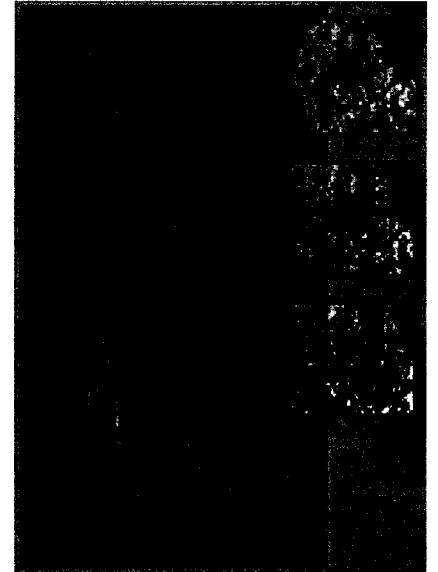


## Objective

To develop machine vision algorithms for near surface small body navigation that provide estimates of

- spacecraft body relative motion
- spacecraft body absolute position
- 3-D surface topography

through on-board processing of imagery.

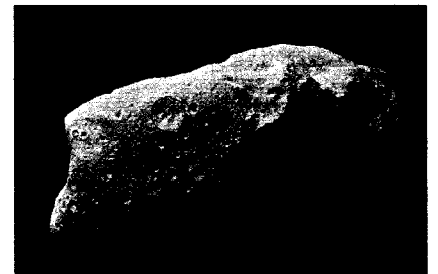


## Benefit

These algorithms enable

- precision guidance and landing
- hazard avoidance
- sample return

from comets and asteroids.



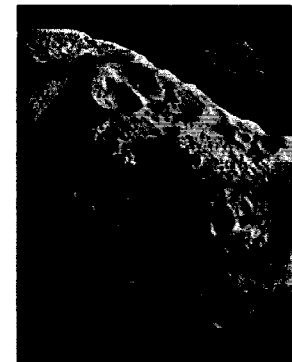


# Motivation



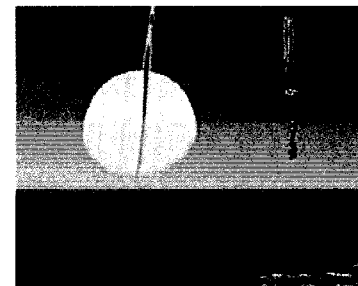
## SSE

- Comet Nucleus Sample Return
  - three landing sites
  - sample return
  - autonomous operations
- Large Asteroid Sample Return
- Titan Organics Explorer
- Europa Precision Landing
- Mars Precision Landing



## ESE

- Intelligent sensor web
- Reconfigurable sensing



## HEDS

- Operations
- Robotic Partners
- Soft Landing



# Approach



## Problems

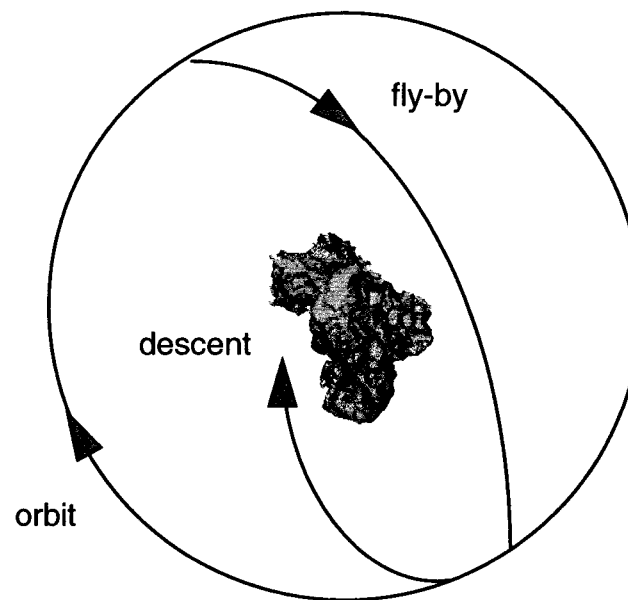
- estimate spacecraft motion and position
- reconstruct surface topography
- detect and avoid hazards

## Challenges

- variable body and spacecraft motion
- variable illumination
- variable altitude/scene scale
- robust and autonomous

## Methods

- feature tracking
- structure from motion
- landmark recognition
- surface matching
- motion stereo

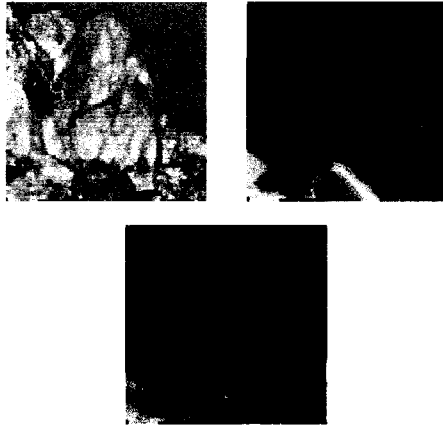




# Sensing Modalities

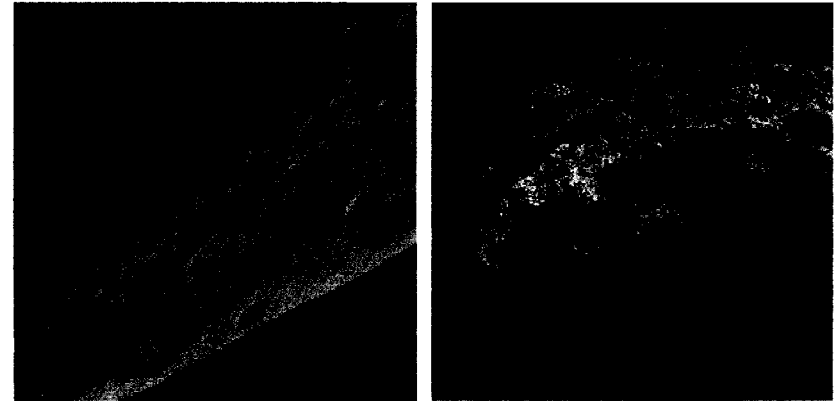


## Rangefinder Imagery

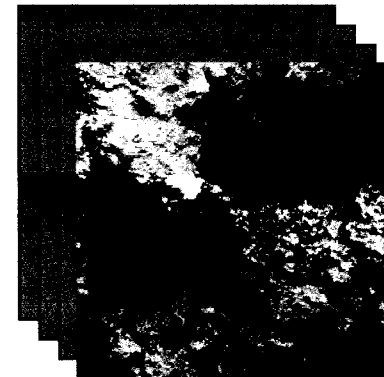


## Camera Imagery

### Single Images

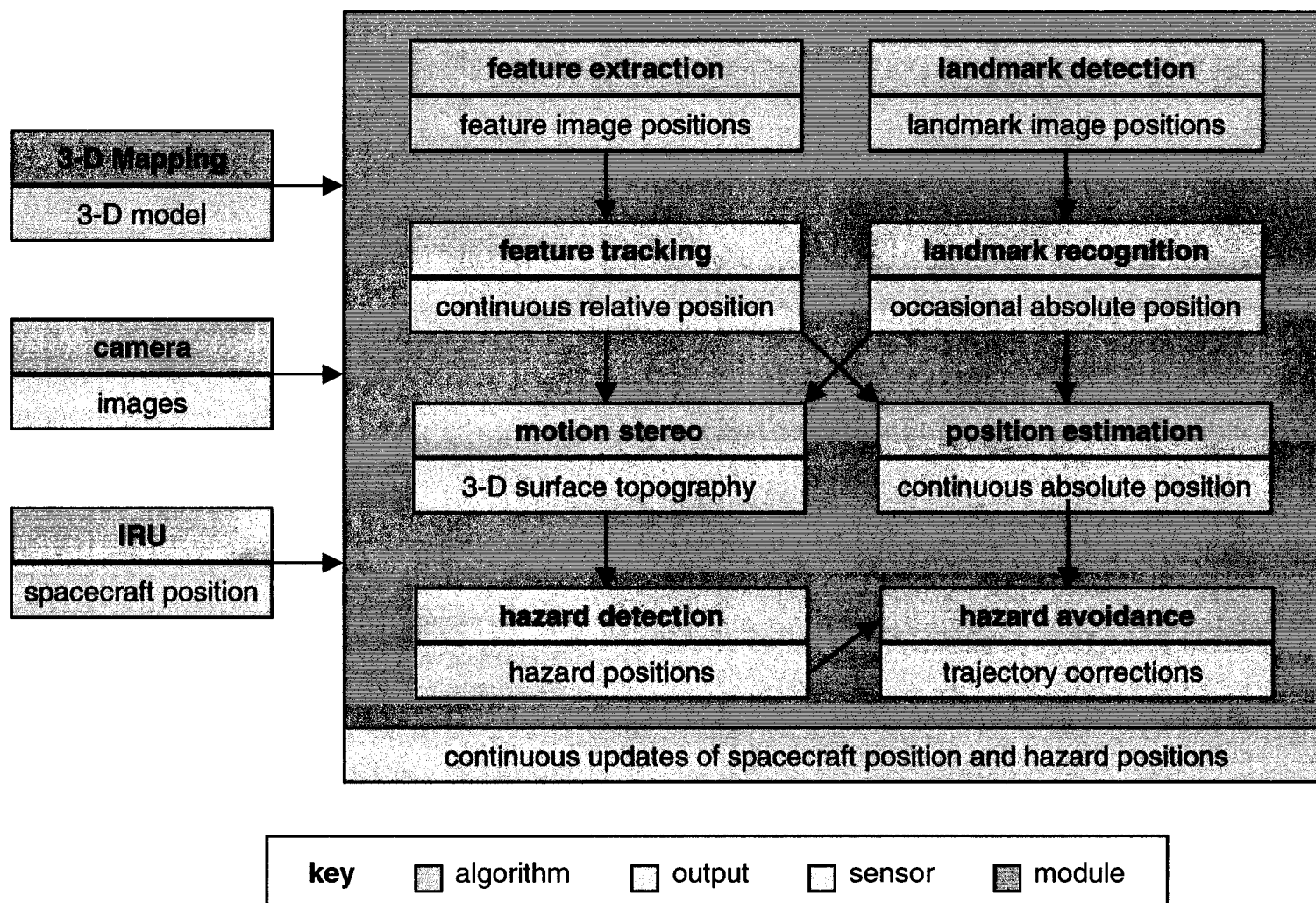


### Image Streams





# Imaging Approach





# Feature Tracking and Motion Estimation



## Objective

- determine motion of spacecraft based on surface imagery

## Approach

- track features (Shi & Tomasi CVPR94)
- estimate motion (Johnson & Matthies ISAIRAS99)

## Application

- precision guidance and landing
- comet and asteroid exploration

images

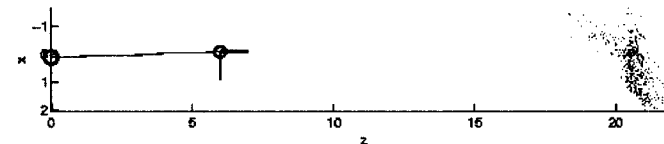


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feature tracks



motion estimation



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# Two Frame Motion Laboratory Test



## Parameters

50 features

640x480 imager

15° FOV

T = (0,0,1.0)cm

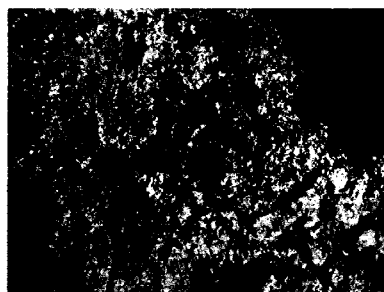
## Results

4 Hz frame rate

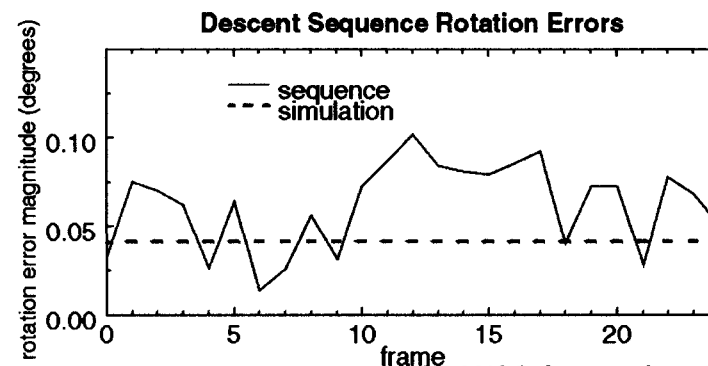
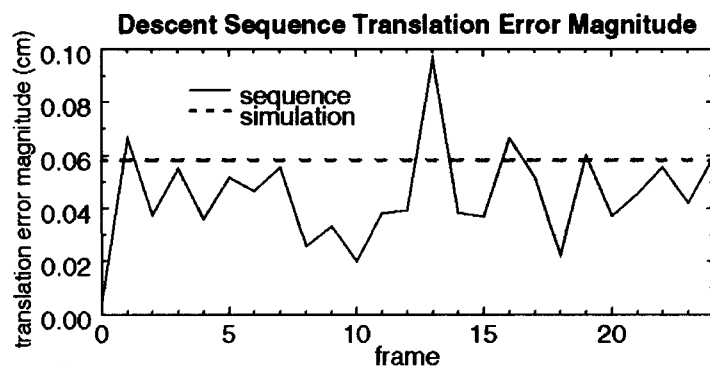
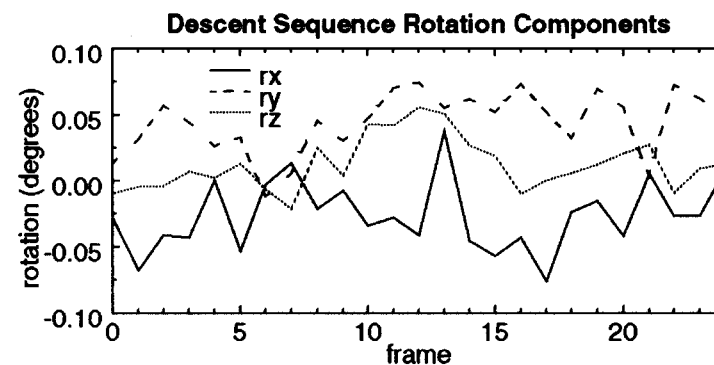
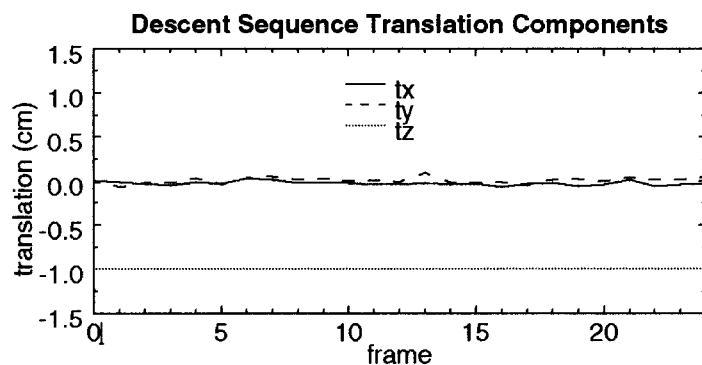
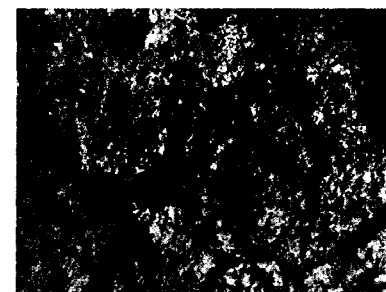
$\epsilon_t = 0.045$  cm

$\epsilon_R = 0.063^\circ$

frame 0



frame 25



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# Multi-Frame Motion Laboratory Test



## Parameters

500 features

1024x1024 imager

25° FOV

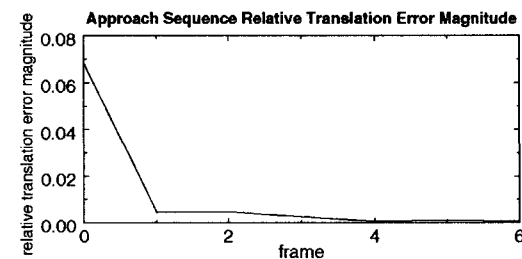
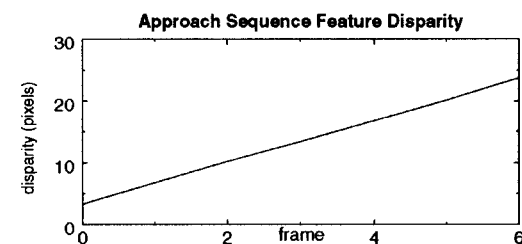
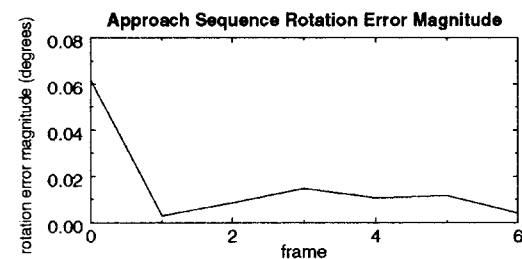
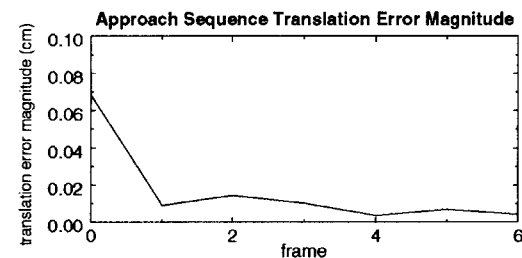
## Results

$\epsilon_t = 0.02/6.00 \text{ cm} = 0.33\%$

$\epsilon_R = 0.01^\circ$



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# Monte Carlo Simulations of Motion Estimation



## Procedure

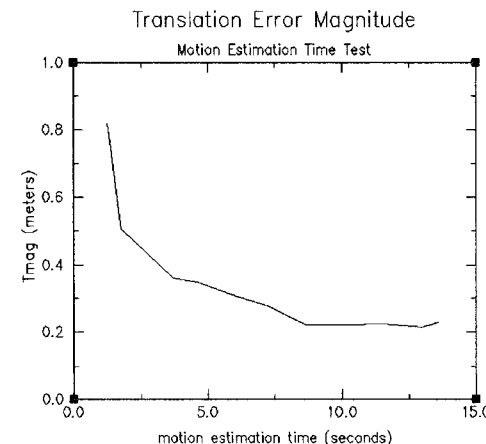
- generate synthetic terrain
- select random pixels for features
- assume perfect tracking with gaussian noise
- intersect optical axis with synthetic terrain for altimeter readings
- compute motion

## Assumptions

- 30° FOV
- 1024x1024 imager
- 1/6 pixel tracking noise
- 1000 m altitude
- 0.2 m altimeter error
- 20 pixel feature disparity
- 500 features

## Results

- two frame descent
  - vertical descent:  $0.22\text{m}/65\text{m} = 0.34\%$
  - 45° descent:  $0.22\text{m}/17\text{m} = 1.3\%$
  - horizontal motion:  $0.22\text{m}/12\text{m} = 1.8\%$
- multi-frame landing
  - horizontal landing error of 3.6m from 1000 m altitude = 0.36%
- pointing
  - 0.006° error for 0.6° off axis pointing
- timing

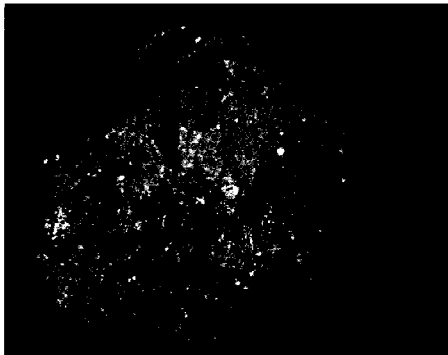




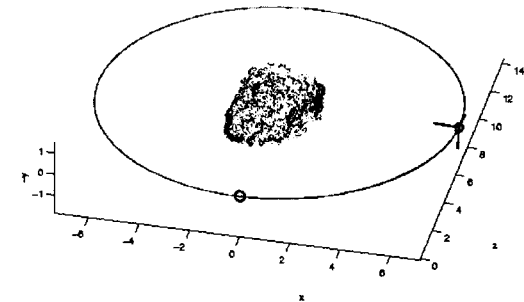
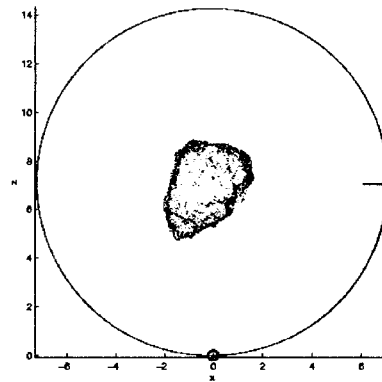
# Orbit Structure From Motion Result



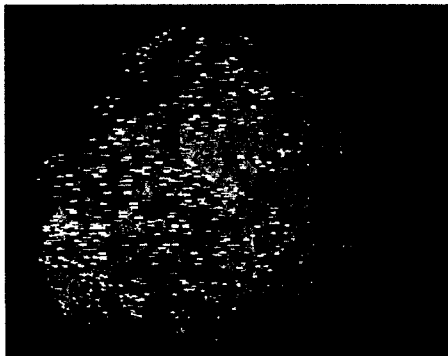
images



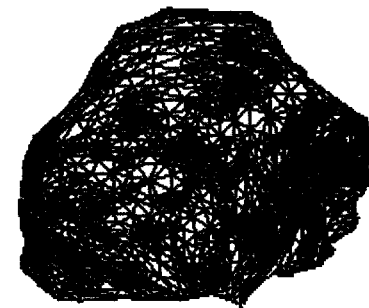
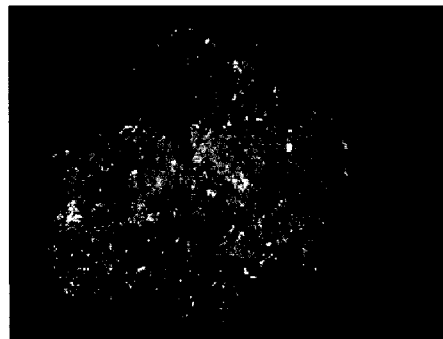
structure from motion



feature tracks



shape verification





# Comet Absolute Position Estimation



## Objective

- determine comet absolute position from orbit

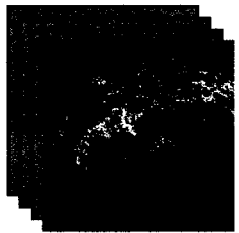
## Application

- precision guidance & landing
- comet exploration

## Approach

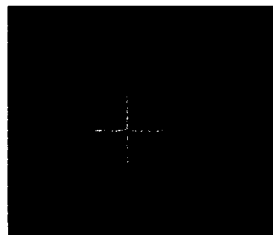
- structure from motion  
(Johnson & Matthies ISAIRAS99)
- match surface topography  
(Johnson & Hebert CVPR 1997)
- estimate position

orbital image stream

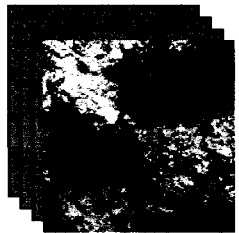


structure from  
motion

complete 3-D model



flyby image stream



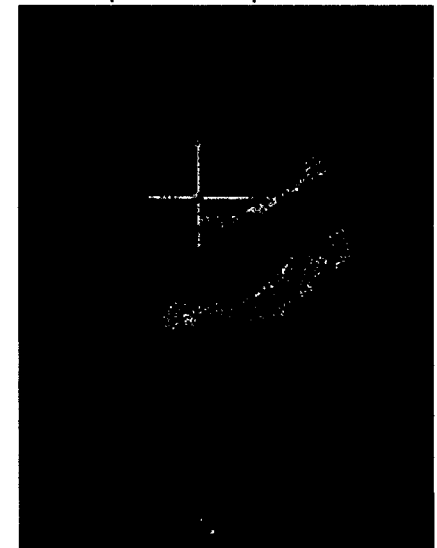
structure from  
motion

3-D surface patch



surface  
matching

spacecraft position





# Motion Stereo



## Objective

- reconstruct dense 3-D surface topography from monocular image streams

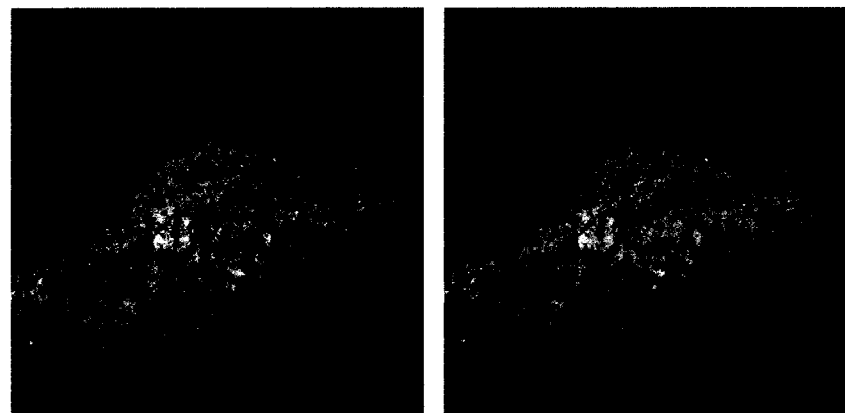
## Approach

- rectify images based on motion
- dense stereo matching (Xiong & Matthies CVPR97)

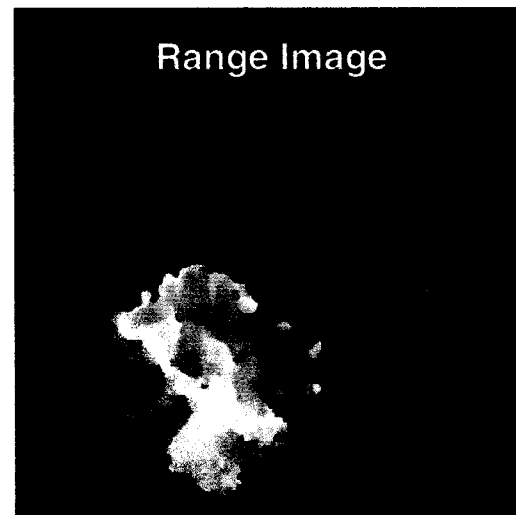
## Application

- hazard detection
- comet landmark detection
- 3-D modeling

motion stereo images



Range Image





# Asteroid Absolute Position Estimation



## Objective

- determine asteroid absolute position from orbit

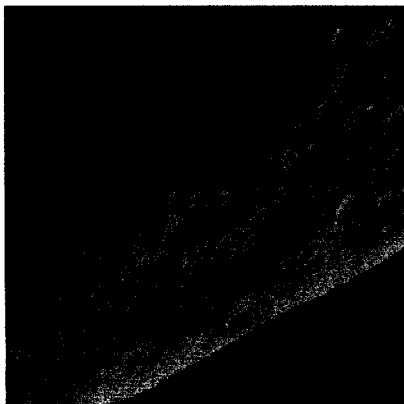
## Application

- precision guidance and landing
- asteroid exploration

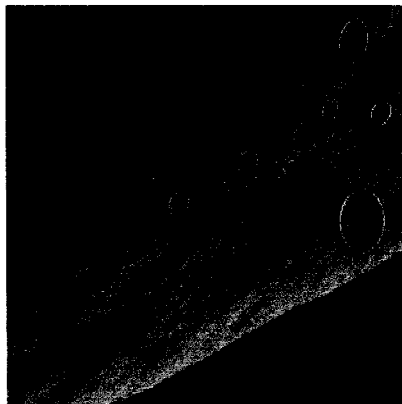
## Approach

- take image
- detect craters  
(Leroy & Medioni CVPR 1999)
- match craters to data base
- estimate position

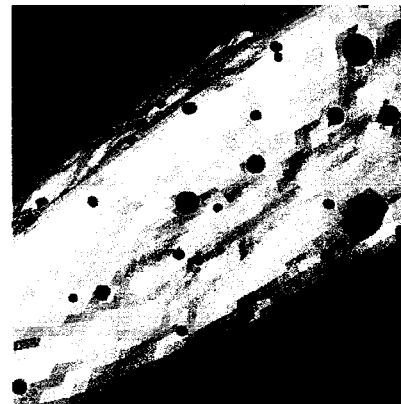
Acquire asteroid image



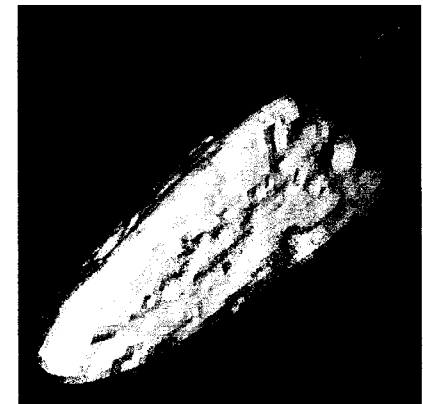
Extract crater landmarks using perceptual grouping



Match 2D image craters to 3D database of craters



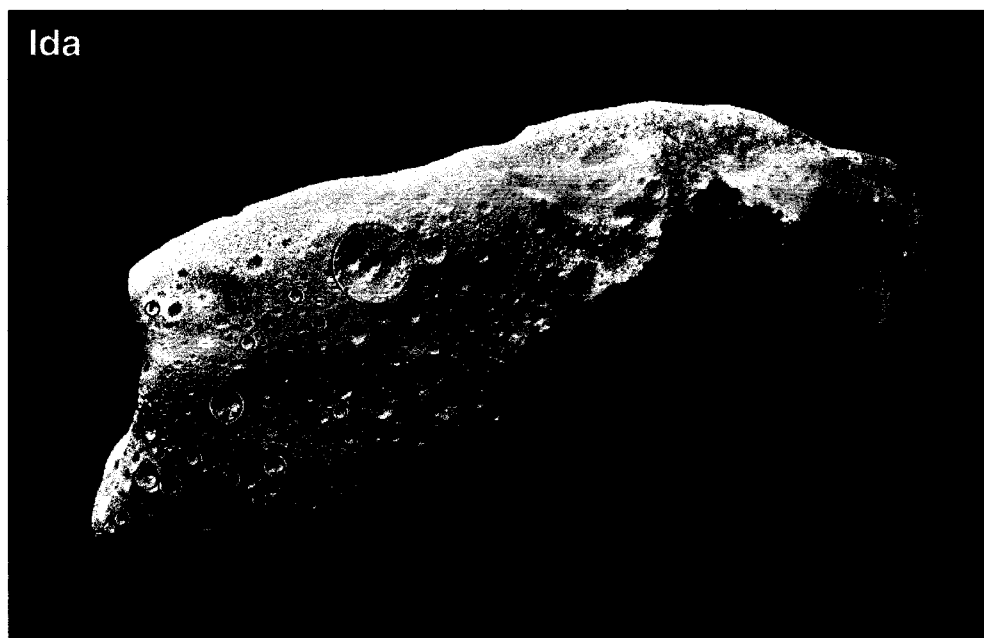
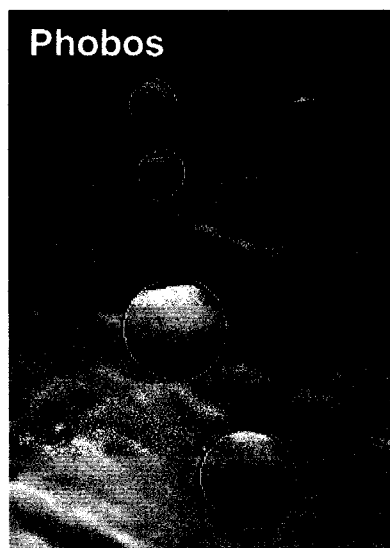
Estimate S/C position from crater matches





# Crater Landmark Detection

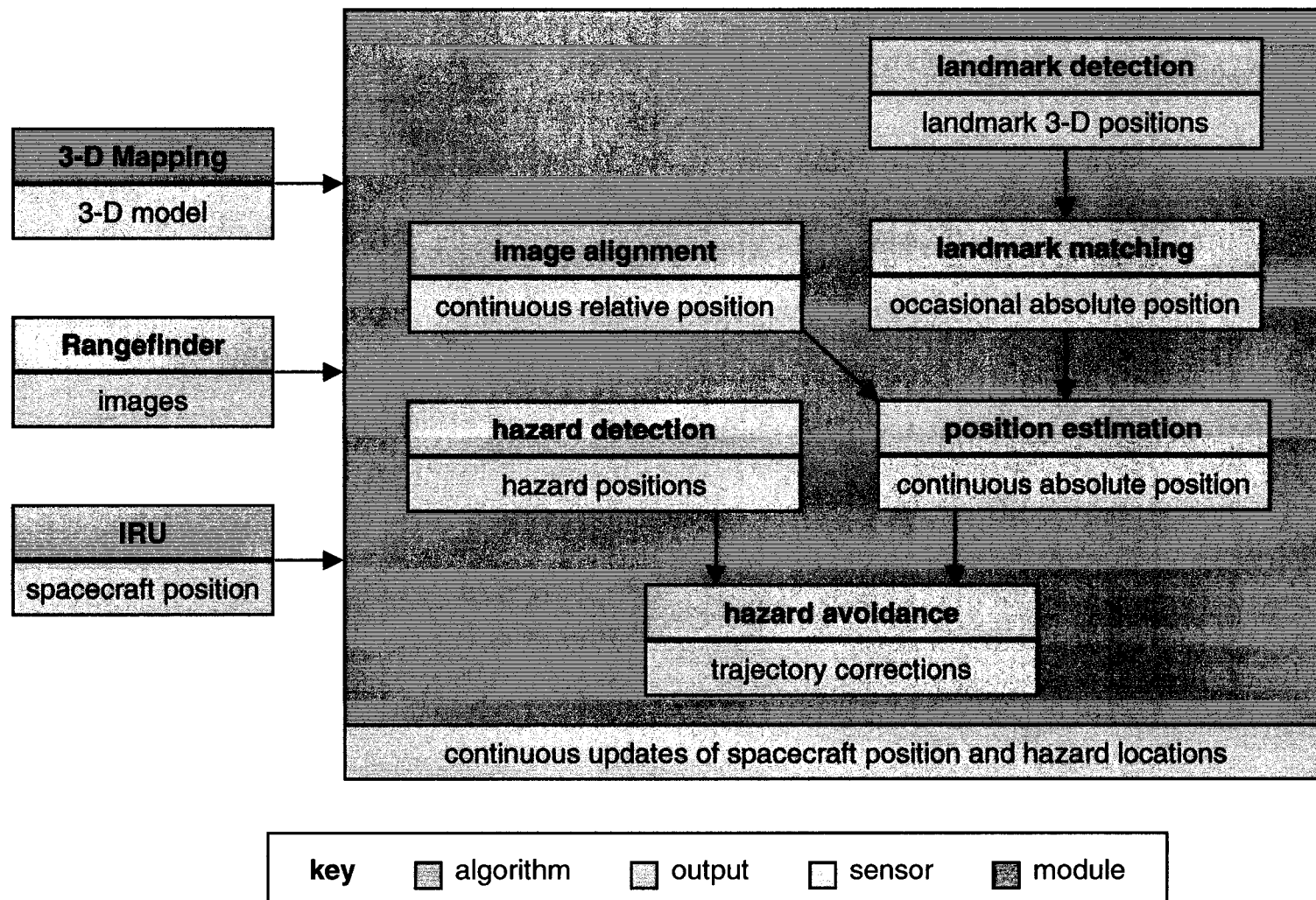
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# Rangefinder Approach





# Image Alignment and Motion Estimation



## Objective

- determine translational motion using on rangefinder imagery

## Approach

- align range images (Johnson & SanMartin 1999)
- estimate motion (Faugeras & Hebert IJRR 1986)

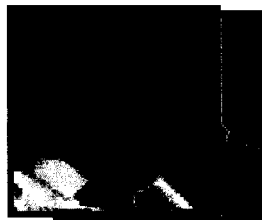
## Application

- precision guidance and landing
- comet and asteroid exploration

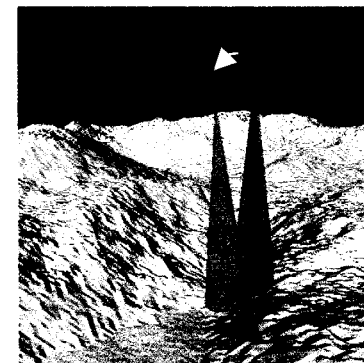
images



align images in 3-D



estimate motion



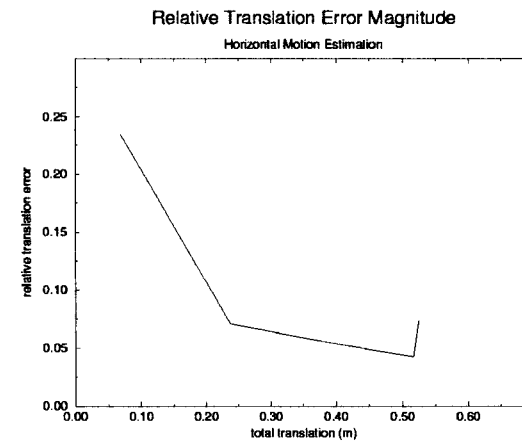
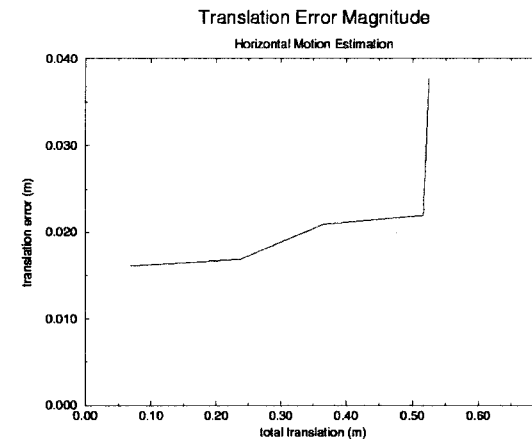


# Horizontal Motion Estimation



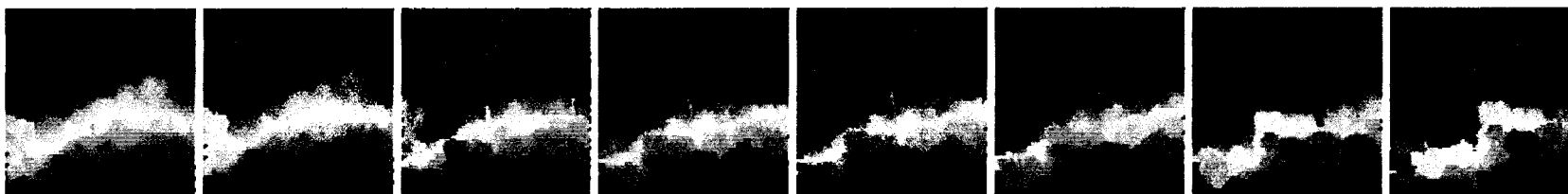
**Parameters**  
100x100 image  
10° FOV  
16 m altitude

**Results**  
5 Hz frame rate  
 $\epsilon_t = 0.05$  m





# Vertical Motion Estimation



## Parameters

100x100 image

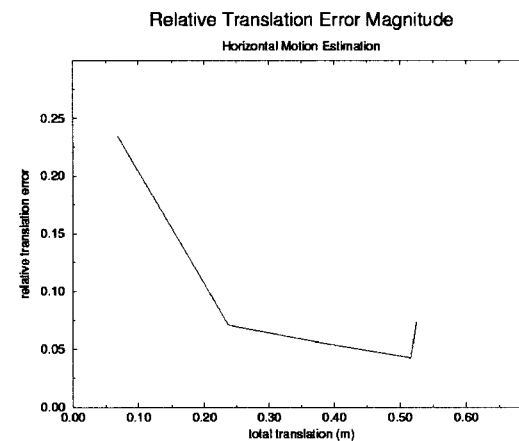
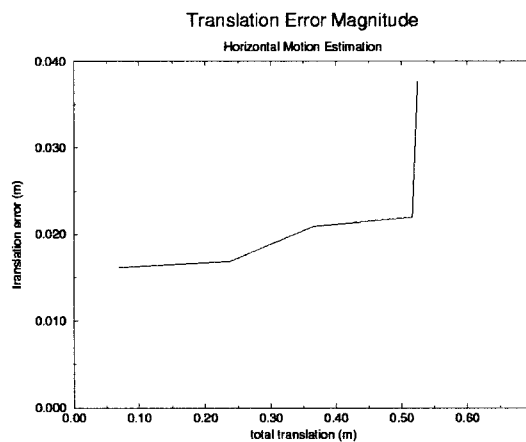
10° FOV

300 m altitude

## Results

5 Hz frame rate

$\epsilon_t = 0.20$  m





# Monte Carlo Simulation of Image Alignment **JPL**

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## Procedure

- generate synthetic terrain
- generate 2 range image
- align images
- compute motion

## Parameters

- 10° FOV
- 100x100 image
- 100 m altitude
- 1.0 m/s motion
- 0.02 m range error
- 0.1 ° divergence
- 0.01° attitude error

## Results

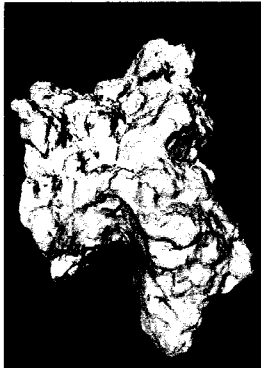
- descent
  - vertical descent:  $0.022\text{m}/10\text{m} = 0.2\%$
  - 45° descent:  $0.026\text{m}/5\text{m} = 0.5\%$
  - horizontal motion:  $0.021\text{m}/3\text{m} = 0.7\%$
- timing
  - 400 ms first frame
  - 200 ms each additional frame
  - 5 Hz



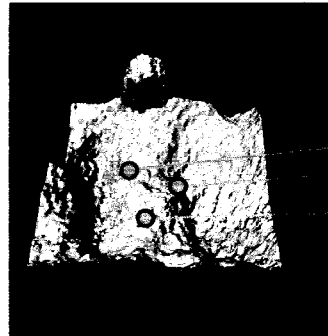
# Absolute Position Estimation



3-D Model



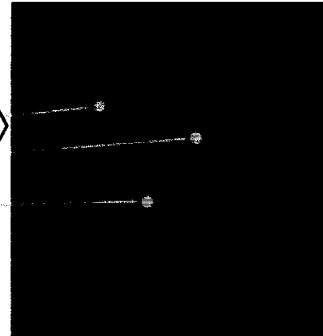
model  
close-up



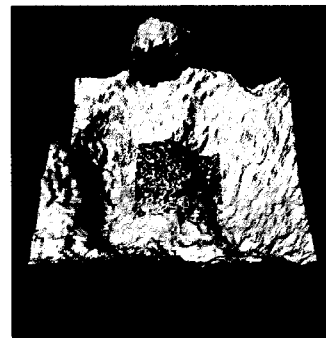
match  
landmarks

align  
surfaces

range  
mesh



range  
image

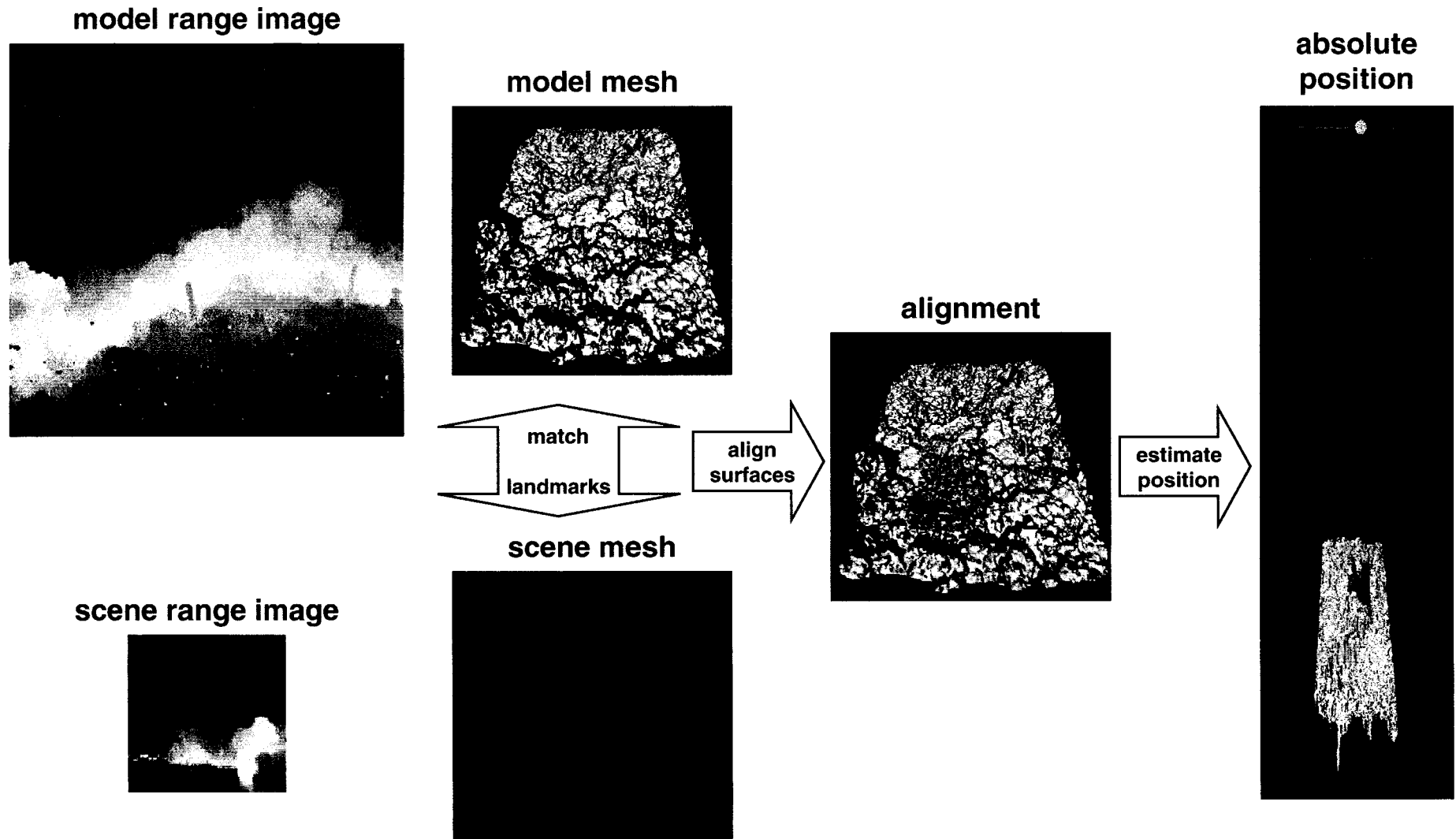


estimate  
position





# Absolute Position Estimation Result





# Comparison of Sensing Modalities

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## Scanning Laser Radar

- + complete 3-D shape sensing
- + efficient algorithms (5 Hz)
- + no ground processing
- + dark side landing possible
- low resolution (100x100)
- short range (~2km)
- continuous data acquisition
- slow frame rate (1 Hz)
- possibly moving parts
- unproven sensor

## Imager and Altimeter

- + high resolution (1000x1000)
- + long range (50 km)
- + instantaneous data acquisition
- + rapid frame rates (30 Hz)
- + no moving parts
- + no ground processing
- + efficient algorithms (4 Hz)
- + proven sensors
- requires target illumination
- shape requires processing
- requires two sensors



## **FROM SIR-C TO SRTM**

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### **ABSTRACT**

The SIR-C/X-SAR (Space-borne Imaging Radar-C/X-band Synthetic Aperture Radar) is a joint U.S./German/Italian project. This instrument aboard the shuttle Endeavour was flown twice in 1994. The NASA SIR-C instrument was fully polarimetric and operated at L-band and C-band simultaneously. The analysis of data from two successful SIR-C/X-SAR deployments showed dramatic new capabilities only possible with a multi-parameter imaging radar. The orbit was trimmed for the last three days of the second flight to repeat the track of the first flight to collect repeat-track interferometric data at all three frequencies.

The SRTM (Shuttle Radar Topography Mission) took advantage of the unique opportunity offered through augmentation of the SIR-C/X-SAR instrument. The SIR-C phased array antenna enabled the ScanSAR mode to achieve a wide swath. Addition of a C-band receive antenna, extended from the shuttle bay on a mast, forms an interferometric baseline with the existing SIR-C C-band antenna. The SRTM is capable of producing a digital elevation model of 80% of the Earth's land surface in a single 11 day Space Shuttle flight. The C-band SRTM is a joint project of the NIMA (National Imagery and Mapping Agency) and the NASA. The SRTM is scheduled to be launched in late 1999.

### **ACKNOWLEDGMENT**

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